A Robust Access Control Protocol for the Smart Grid Systems

Muhammad Tanveer[®], Abd Ullah Khan[®], Neeraj Kumar[®], *Senior Member, IEEE*, Alamgir Naushad[®], and Shehzad Ashraf Chaudhry[®]

Abstract—Lightweight cryptography (LWC)-based authenticated encryption with associative data (AEAD) cryptographic primitives require fewer computational and energy resources than conventional cryptographic primitives as a single operation of an AEAD scheme provides confidentiality, integrity, and authenticity of data. This feature of AEAD schemes helps design an access control (AC) protocol to be leveraged for enhancing the security of the resource-constrained Internet of Things (IoT)enabled smart grid (SG) system with low computational overhead and fewer cryptographic operations. This article presents a novel and robust AC protocol, called RACP-SG, which aims to enhance the security of resource-constrained IoT-enabled SG systems. RACP-SG employs an LWC-based AEAD scheme, ASCON and the hash function, ASCON-hash, along with elliptic curve cryptography to accomplish the AC phase. Besides, RACP-SG enables a smart meter (SM) and a service provider (SEP) to mutually authenticate each other and establish a session key (SK) while communicating across the public communication channel. By using the SK, the SM can securely transfer the gathered data to the SEP. We verify the security of the SK using the widely accepted random oracle model. Moreover, we conduct Scyther-based and informal security analyses to demonstrate that RACP-SG is protected against various covert security risks, such as replay, impersonation, and desynchronization attacks. Besides, we present a comparative study to illustrate that RACP-SG renders superior security features while reducing energy, storage, communication, and computational overheads compared to the state of the art.

Index Terms—Access control (AC), authenticated encryption with associative data (AEAD), authentication, privacy, security, smart grid (SG).

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Muhammad Tanveer and Abd Ullah Khan are with the Faculty of Computer Science and Engineering, GIK Institute of Engineering Sciences and Technology, Topi 23640, Pakistan (e-mail: tanveer.m@giki.edu.pk; newabd470@gmail.com).

Neeraj Kumar is with the Department of Computer Science Engineering, Thapar Institute of Engineering and Technology, Deemed University, Patiala 147004, India, also with the School of Computer Science, University of Petroleum and Energy Studies, Dehradun 248007, India, and also with the Department of Computer Science and Information Engineering, Asia University, Taichung City 413, Taiwan (e-mail: neeraj.kumar@thapar.edu).

Alamgir Naushad is with the School of Electrical Engineering and Computer Science, National University of Sciences and Technology, Islamabad 44000, Pakistan (e-mail: anaushad@nbc.nust.edu.pk).

Shehzad Ashraf Chaudhry is with the Department of Computer Engineering, Istanbul Gelisim University, 34310 Istanbul, Turkey (e-mail: sashraf@gelisim.edu.tr).

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I. Introduction

CYBER-PHYSICAL system (CPS) contains multiple components that interact and communicate using the public Internet [1], [2]. This way, CPS is envisaged to be an essential part of future applications. Among these applications, smart grid (SG) systems are conceived to be the most important, wherein a user's sensitive information is transmitted from and to the user. Particularly, SG systems integrated with the Internet of Things (IoT) are essential for realizing smart homes. This way, SG systems enable users to customize the power utilization and its cost, thereby leading to smart homes applications [3].

An SG system contains service providers (SEPs) and smart meters (SMs). SEPs perform actuation, control, and communication processes to ensure an uninterruptible and flawless power supply. The SMs contain sensing and communicating modules and are responsible for collecting and transmitting the information to SEPs in real time via public channels [4], [5]. Such channels are prone to various types of attacks that enable an adversary to access the exchanged information between SMs and SEPs in the SG system. Therefore, a secure and robust access control (AC) protocol is necessary to enable the SG system entities to exchange information securely after establishing the session key (SK).

Several authenticated key exchange (AKE) and AC protocols have been proposed that enable the SG system's components to communicate after establishing an SK securely. However, most of them cannot protect users' anonymity and untraceability. Besides, many of them are prone to manin-the-middle (MITM), replay, SM and SEP impersonation, privilege-insider (PI), ephemeral secret leakage (ESL), and SM physical capture attacks. Additionally, a number of these protocols are unable to provide mutual authentication and SK security. We propose an AC protocol to overcome the security threats and vulnerabilities associated with the existing AKE and AC protocols. The proposed AC protocol uses lightweight cryptography (LWC)-based authenticated encryption with associative data (AEAD) in conjunction with elliptic curve cryptography (ECC).

A. Novelty and Research Contributions

Recently, an increasing number of AEAD algorithms are being proposed, focusing on the provisioning of encryption/decryption functions in resource-constrained devices [6]. As shown in Fig. 1, at the source side, an AEAD scheme

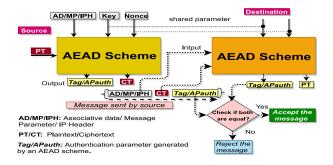


Fig. 1. High-level depiction of AEAD schemes' functionality—the base module of our proposed protocol.

accepts a key, an initialization vector/nonce, associative data (AD), and plaintext (PT) as inputs and generates the ciphertext (CT) and Authentication Parameters (Tag/APauth) as outputs. The AD indicates the data required to be secured in an unencrypted state. For instance, the information contained in an IP header, or any part of a message (identity, pseudo-identity), requiring essential integrity at the destination, can be considered as AD here. The PT in the scheme is made confidential through the CT generated by an AEAD scheme. Similarly, both CT and AD are authenticated by APauth, such that an APauth carries out the message authentication functionality to facilitate the AD and CT authentication at the destination. This approach adopted by an AEAD scheme enables it to ensure data integrity, confidentiality, and authenticity simultaneously and with a single operation. This suggests that an AEAD-based scheme can potentially lead toward a reduced number of cryptographic operations required to be performed in an AC process. Besides, the AEAD scheme is less resource intensive and is suitable for an environment where many devices communicate with the server. Therefore, a resourceefficient AC protocol is possible to be designed using an AEAD scheme. The proposed AC protocol is based on the process (method) presented in Fig. 1. This article contains the following contributions.

- We propose a Robust AC Protocol for SG-System, called RACP-SG, which employs the AEAD scheme "ASCON" and hash function "ASCON-hash" along with ECC to perform the AC phase. RACP-SG enables the SG system's entities, such as SMs and SEPs, to establish an SK after achieving mutual authentication. Moreover, SMs and SEPs can exchange sensitive information using the established SK. Furthermore, RACP-SG renders the functionality of dynamic SM addition.
- 2) It is shown through informal security analysis that RACP-SG is resilient against various types of attacks, such as replay, MITM, SM physical capture, and impersonation attacks. It is also shown that RACP-SG ensures untraceability and traceability features. Besides, the SK's security is validated through the well-known random oracle model (ROM). Moreover, the strength of RACP-SG is illustrated through Scyther-based analysis.
- The performance evaluation shows that RACP-SG incurs lesser computational, communication, and storage

overheads, compared to the state of the art, without compromising the security functionalities and features.

B. Paper Organization

The remainder of this article is organized as follows. Related work is presented in Section II. The system model employed for RACP-SG is presented in Section III. Preliminaries are presented in Section IV. The details of the RACP-SG are presented in Section V. The security analysis of RACP-SG is presented in Section VI. The performance evaluation of RACP-SG is presented in Section VII, and the conclusion is presented in Section VIII.

II. RELATED WORK

This section provides an overview of various security schemes proposed for the SG system. Gunduz and Das [3] surveyed various security requirements to ensure secure communication among the SG system entities. Odelu et al. [7] proposed an ECC AKE for the SG system. However, their scheme cannot resist MITM, Denial-of-Service (DoS), and ESL attacks and does not provide anonymity and perfect forward secrecy (PFS) features. Li et al. [8] proposed a message authentication scheme based on ECC and a secure hash algorithm (SHA-160) for SG systems. However, the scheme is insecure against DoS and impersonation attacks. Similarly, Chen et al. proposed a scheme to improve the security of SG systems in [9]. However, as proved in [10], the scheme proposed by Chen et al. cannot withstand impersonation and ESL attacks. Kumar et al. proposed a scheme in [11] to enhance the security of the SG system. However, their scheme is proved by Yahya et al. [12] to be invalid against ESL, SV, and traceability attacks. Bera et al. [13] proposed an ECCbased AC protocol for the SG system and utilized ROM to prove the security of the established SK. However, the AC protocol of Bera et al. [13] cannot protect De-Synchronization (De-Syn) attacks. Moreover, Bera et al. [14] propounded an AC protocol for the Internet of Drones (IoD) to enable secure communication between the drone and ground station. To this end, the scheme uses ECC and SHA-256 to perform the SK establishment process after getting authenticated with the server. However, Chaudhry et al. [15] showed that the scheme of Berra et al. [13] cannot resist impersonation, MITM, and replay attacks.

Li et al. [8] propounded SHA-160 and an ECC-based security scheme for the SG system to ensure indecipherable communication after establishing an SK among the SM and SEPs. However, the scheme cannot resist replay, MITM, and ESL attacks. Besides, the scheme does not ensure SM anonymity and forward secrecy, and cannot provide MA features. An ECC and SHA-160-based AKE scheme was presented by Mahmood et al. [16]. However, the scheme cannot resist PI, impersonation, replay, SM capture, and ESL attacks. Besides, the scheme cannot ensure the anonymity of MA and SM. Likewise, Mahmood et al. proposed an ECC-based authentication scheme for the SG system in [17], which is again insecure against PI, MITM, replay, impersonation, and SM capture attacks and also does not ensure

TABLE I
SUMMARY OF RELATED AC PROTOCOLS

AC protocol	Year	Primitives utilized	Limitations/Shortcomings
Mahmood et al. [16]	2016	SHA-160, XOR, and ECC	Cannot withstand against replay, MITM, impersonation, ESL attacks.
Mahmood et al. [17]	2018	SHA-160, XOR, and ECC	Unprotected against DoS, PI, replay, MITM, impersonation, ESL attacks.
Dariush et al. [18]	2018	SHA-160, XOR, and ECC	Unprotected against DoS attack. Unable to render SM anonymity and SK security.
Odelu et al. [7]	2018	SHA-160, XOR, and ECC	Vulnerable to DoS, MITM, and impersonation attacks. Does not ensure SM anonymity.
Li et al. [8]	2019	SHA-160, XOR, and ECC	Cannot restrain replay, MITM, ESL attacks. Unable to provide MA and anonymity features.
Bera et al. [13]	2020	SHA-256, XOR, and ECC	Cannot restrain De-Syn attack.
Bera et al. [14]	2020	SHA-256, XOR, and ECC	Unsafe against De-Syn attack.
Ayub <i>et al</i> . [19]	2020	SHA-160 and XOR	Cannot withstand De-Syn attack.
Tanveer et al. [20]	2020	SHA-160, ASCON, and XOR	Cannot restrain De-Syn attack.
Chaudhry et al. [21]	2020	SHA-160, ECC, and XOR	Insecure certificate computation. Does not resist device capture attack.
Chaudhry et al. [15]	2021	ECC, SHA-160, and XOR	Cannot restrain ESL, DI, SI/SPI, device capture, and SK disclosure attacks.

anonymity and forward secrecy features. Abbasinezhad-Mood and Nikooghadam proposed an ECC-based AKE scheme for SG system in [18]. However, their scheme cannot resist replay attacks and does not ensure SM anonymity. Jo *et al.* presented an ECC-based scheme in [22], which cannot protect ESL and impersonation attacks and does not provide anonymity and untraceability features.

Mahmood et al. presented a bi-linear pairing-based authentication scheme in [23] for the SG system. However, the scheme is proved by the authors in [24] to be ineffective against ESL and impersonation attacks. Chaudhry et al. proposed a certificate-based AC protocol in [21] for the SG system, which uses ECC and SHA-160. Likewise, Tanveer et al. presented an ASCON and SHA-256-based authentication scheme in [20] for the 6LoWPAN environment, which is vulnerable to De-Syn attacks. In the same fashion, the scheme presented by Ayub et al. [19] cannot withstand the De-Syn attacks. Wu et al. presented a message authentication scheme in [25] for the SG system, which is based on the Diffie-Hellman key exchange mechanism. However, the scheme cannot resist the ESL attack and does not provide anonymity features. Similarly, the scheme presented by Bera et al. [13] does not provide the anonymity feature. Badar et al. [26] presented an identity-based authentication scheme for SG systems, which uses ECC and a hash function. Likewise, an enhanced pairingbased authentication scheme for the SG system is presented in [27], which uses ECC and hash function. Similarly, Srinivas et al. [1] presented a signature-based authentication scheme for SG system, which is able to check various pernicious security attacks. A summary of the related AC protocols is given in Table I.

III. SYSTEM MODEL

A. Authentication Model

To accomplish the AC process in RACP-SG, we consider the authentication model as shown in Fig. 2. There are three components in the model, such that trusted authority (TA), service provider (SEP $_j$ |j=1,2,3,...,Nse) where Nse denotes the number of deployed SEP $_j$, and (SM $_n$ |n=1,2,3,...,Ns) where Nse denotes the number of SMs deployed in SG system. The TA is a highly trusted entity and has sufficient computational resources to monitor and control the whole SG system. In RACP-SG, TA is responsible for registering SMs and SEPs, and for system initialization. The SEPs are the organizations that render services to electricity customers and

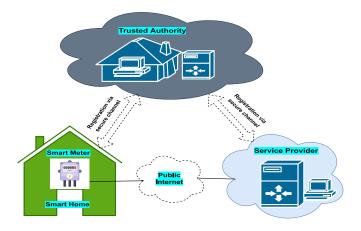


Fig. 2. Application scenario: SG system.

have sufficient computational resources. The SMs are devices with constrained resources, responsible for the electricity consumption and control of the smart home appliances installed in a household. After collecting the sensitive information, SMs transmit the collected information to SEPs via the public Internet. Therefore, to ensure secure information exchange, an AC protocol is imperative in the SG system.

B. Threat Model

We utilize the widely used threat model, i.e., Dolev-Yao (DY) model [28], to validate the strength of RACP-SG against various types of attacks. Moreover, it is assumed that under the DY model, an adversary can potentially access the communicated information since the information is exchanged on public channels. This way, the adversary can capture, delete, or modify the content of the messages being exchanged on the public channel among the communicating nodes. Moreover, the adversary can also capture SM_n physically and can extract, using the power analysis attack, the sensitive information stored in the memory of SM_n . The extracted information can be used to launch various types of attacks, including impersonation and MITM attacks. Furthermore, it is assumed that SM_n is unreliable and untrustworthy while SEP_i is stationed under the physical lock and adversary cannot capture SEP_i physically.

IV. PRELIMINARIES

A. ASCON

ASCON [29] is an online AEAD scheme, which renders confidentiality, authenticity, and integrity of the data simultaneously. The encryption process of ASCON can be defined by the following expression: (CT, APauth) = $\mathcal{E}_K\{(N, AD), PT\}$, where CT, APauth, N, AD, K, and PT denote CT, authentication parameter (Tag), nonce, AD, key, and PT, respectively. In addition, the decryption process can be represented by the following expression: (PT, APauth') = $\mathcal{D}_K\{(N, AD), CT\}$, where CT, APauth, N, AD, K, and PT denote CT, authentication parameter (Tag), nonce, AD, key, and PT, respectively. The authenticity of the retrieved PT is verified by the equation APauth = APauth'. In the proposed RACP-SG, ASCON is used as the encryption/decryption scheme.

B. Physical Unclonable Function

It is assumed that SM_n is equipped with a reliable physical unclonable function (PUF). A PUF function generates the same response to a given input challenge. For two different input challenges, PUF generates different response outputs. PUF takes challenge Ch_{SM_n} as the input and generates response RES, which can be expressed by the expression RES = PUF(Ch_{SM_n}).

C. Fuzzy Extractor

The fuzzy extractor (FE) is utilized to generate a stable secret key. FE comprises two algorithms, such as the key generation algorithm denoted by $Gen(\cdot)$ and the key reproduction algorithm denoted by $Rep(\cdot)$. The $Gen(\cdot)$ generates a stable and unique key Key_{SM_n} and reproduction parameter RP by taking RES as the input, i.e., $Gen(RES) = (Key_{SM_n}, RP)$. The $Rep(\cdot)$ algorithm, which takes RP and RES' as the inputs and reproduces Key_{SM_n} , i.e., $Rep(RES', RP) = Key_{SM_n}$ provided the condition $HMD(RES, RES') \le ETL$, where HMD denotes the Hamming distance and ETL represent the error tolerance. The details of FE can be found in [30] and [31].

V. PROPOSED RACP-SG PROTOCOL

This section presents an AC protocol, called RACP-SG, for the SG system. The proposed RACP-SG comprises system initialization, SM registration (SMR), AC, Dynamic SM deployment, and phases. Table II tabulates the notations used in the RACP-SG protocol. RACP-SG employs an AEAD scheme known as ASCON, ASCON-hash function, and ECC to design the robust AC protocol for the SG environment. The output size of the ASCON-hash function is 256 bits, we can split it into two chunks to derive a parameter of 128 bits. The ASCON-hash function is faster than SHA-160 and renders the same features as other SHA-160/256. All phases of RACP-SG are described in detail in the succeeding sections.

A. System Initialization Phase

The TA selects an elliptic curve $E_p(m, n)$ over Z_p , where Z_p is the prime field with ensuring condition $4m^3 + 27n^2 \neq 0 \pmod{p}$. The TA selects a base point P over $E_p(m, n)$ whose

TABLE II LIST OF NOTATIONS USED IN RACP-SG

Notation	Description
$PUF(\cdot)$	Physically unclonable function
CH_{SM_n}	Challenge parameter provided as the input to $PUF(\cdot)$
RES_{SM_n}	Response generated by $PUF(\cdot)$
*	Common server parameter generated by SEP_i , which is
SP, SP_2	known only to SEP_i
ID_{SM_n}	Identity of SM_n generated using $PUF(\cdot)$
SID_{SM_n} , PID_{SM_n}	Temporary and real of SM_n
ID_{SEP_j}	Real-Identity and secret key of SEP_j
$E_p(m,n), P$	Non singular Elliptic Curve with base point P
SK_{SEP_j} , Pbk_{SEP_j}	Private and Public key of SEP_j
$SK_{SEP_j-SM_n}$	Shared secret between SEP_j and SM_n generated using ECC
$SK_{SM_n-SEP_j}$	Shared secret between SM_n and SEP_i generated using ECC
SK_{SM_N} , Pbk_{SM_n}	Private and Public key of SM_n
$(CT_{SEP_i}, APauth_{SEP_i})$	Ciphertext and AP stored at SEP_i
$(CT_x, APauth_x)$	Ciphertext and AP generated by SM_n during AC phase
$(CT_z, APauth_z)$	Ciphertext and AP generated by SEP_i during AC phase
DT DT	Plaintext to be encrypted by by using ASCON encryption
PT_z , PT_{SEP_j}	process at SEP_i
TM_x , TM_z	Timestamps used during RACP-SG's AC phase
T_{DL} , T_{RM}	Allowed delay time and received time of a message
4.D. 4.D.	Associative data used in ASCON's encryption/decryption
AD_x , AD_z	process
NY NY NY	Nonces used in ASCON's encryption/decryption process dur-
N_x, N_z, N_{SEP_j}	ing AC phase
S () D ()	ASCON's encryption/decryption of string "mg" using secret
$\mathcal{E}_K(mg), \mathcal{D}_K(mg)$	key
TC TC TC	Secret key used in ASCON's encryption/decryption process
$K_{SM_n}, K_1, Key_{SM_n}$	during AC phase
RN_x , RN_z	Random number used in RACP-SG's AC phase
6 () BB B ()	FE key generation, reproduction parameter, and reproduction
Gen(.), RP, Rep(.)	function, respectively
4 77/) 0	Adversary, hash function, concatenation, and XOR, respec-
$\mathcal{A}, H(.), \parallel, \oplus$	tively

order is as big as p, say "N," such that $N \cdot P = O$, where O denotes "zero point." To deploy SEP_j , TA selects an identity ID_{SM_n} and secret key SK_{SEP_j} for a specific SEP_j and computes the public key for SEP_j as $Pbk_{SEP_j} = SK_{SEP_j} \cdot P$. Finally, TA stores credentials $\{ID_{SEP_j}, SK_{SEP_j}\}$ in the temper resistance database of SEP_j .

Definition 1: For any $Pbk_{SEP_j} = SK_{SEP_j} \cdot P$, ADV^{ECDLP} (POT) denotes \mathcal{A} 's probability to procure SK_{SEP_j} within polynomial time (POT), which is trivial, and it is also referred to as the elliptic curve discrete logarithm problem (ECDLP).

B. SM Registration Phase

In the SMR phase, SM_x registers itself with TA. TA preloads the secret parameters in the memory of SM_n , which are validated during the AC phase. The following steps are necessary to accomplish the SMR phase.

1) Step SMR-1: SM_n dispatches a registration request message to TA. After receiving the registration request message form SM_n , TA selects random number RN, pseudo identity PID_{SM_n} , and Ch_{SM_n} , each of size 128 bits for an SM_n . In addition, TA computes server parameter SP as $SP = H(SK_{SEP_j}||ID_{SEP_j})$ and temporary identity for SM_n as $SID_{SM_n} = (PID_{SM_n}||RN) \oplus SP$. To retrieve the record related to SM_n , TA uses PID_{SM_n} during the AC process. Finally, TA sends the massages MG_r : $\{Ch_{SM_n}, SID_{SM_n}\}$ to SM_n via a secure channel.

2) Step SMR-2: After receiving MG_r from TA, SM_n computes $RES_{SM_n} = PUF(Ch_{SM_n})$, $(Key_{SM_n}, RP) = Gen(RES_{SM_n})$, $Z = H(Key_{SM_n})$ and $ID_{SM_n} = Z_1 \oplus Z_2$, where Z_1 and Z_2 are two chunks of Z, each of 128 bits. The parameters RES_{SM_n} , Key_{SM_n} , RP, and ID_{SM_n} denote the response, key parameter, reproduction parameter, and real identity of SM_n ,

Trusted Authority TA	Smart Meter SM_n
picks RN , PID_{SM_n} , and Ch_{SM_n} , computes $SP = H(SK_{SEP_j} ID_{SEP_j})$, $SP_n = (PID_n PN) \cap SP_n$	computes $RES_i = PUF(Ch_{SM_o}),$
$SID_{SM_n} = (PID_{SM_n} \parallel RN) \oplus SP$ $SID_{SM_n} = (SID_{SM_n} \mid RN) \oplus SP$ $SID_{SM_n} = (SID_{SM_n} \mid RN) \oplus SP$	$(Key_{SM_n}, RP) = Gen(RES_i),$ $Z = H(Key_{SM_n}), ID_{SM_n} = Z_1 \oplus Z_2,$
$ \frac{MGr_1(DIDS_{Mn_1}(Nn_{SM_n}))}{SEP_j \to SM_n \text{ via open channel}}, $ $ \text{computes } PT_{SEP_3} = (Key_{SM_n} \parallel ID_{SM_n}), $	$\leftarrow \frac{\{ID_{SM_n}, Key_{SM_n}\}}{SM_n \rightarrow SEP_j \ via \ secure \ channel} .$
computes $T_{1SEP_j} - (Keyg_{M_n} \parallel TDS_{M_n}),$ $K = SP_a + SP_b, N_{SEP_j} = SP_a,$ $(CT_{SEP_j}, APauth_{SEP_j}) = \mathcal{E}_K\{(N_{SEP_j}), PT_{SEP_j}\}$ finally TA stores following credential in the memory of SEP_i	finally, SM_n stores the following credentials in own memory.
$\{PID_{SM_n}, CT_{SEP_j}, APauth_{SEP_j}, SK_{SEP_j}, Pbk_{SEP_j}\}$	$\{SID_{SM_n}, Ch_{SM_n}, RP\}$

Fig. 3. Registration phase of RACP-SG.

respectively. Finally, SM_n sends MG_{r2} : { Key_{SM_n} , ID_{SM_n} } to TA via a secure channel and stores the credentials { SID_{SM_n} , Ch_{SM_n} , RP} in its own memory.

3) Step SMR-3: After receiving MG_{r2} , it computes $PT_{SEP_j} = (Key_{SM_n} || ID_{SM_n})$, where PT_{SEP_j} is the PT. In addition, TA computes $K = SP_a \oplus SP_b$, where SP_a and SP_b are two chunks of SP, each of 128 bits, and nonce $N_{SEP_j} = SP_a$. Moreover, TA computes $(CT_{SEP_j}, APauth_{SEP_j}) = \mathcal{E}_K\{(N_{SEP_j}), PT_{SEP_j}\}$ by using the ASCON encryption process. Finally, TA stores the credentials $\{PID_{SM_n}, CT_{SEP_j}, APauth_{SEP_j}, SK_{SEP_j}, Pbk_{SEP_j}\}$ in the memory SEP_j . The SMR phase is summarized in Fig. 3.

C. AC Phase

In this phase, SM_n achieves the authentication with SEP_j and establishes an SK with SEP_j for indecipherable communication in the future. To establish an SK, both SM_n and SEP_j require to execute the following steps.

1) Step AC-1: SM_n selects TM_x , SK_{SM_n} , and RN_x of size 32, 160, and 128 bits, respectively. Moreover, SM_n computes

$$Pbk_{SM_n} = SK_{SM_n} \cdot P \tag{1}$$

$$SK_{SEP_i-SM_n} = SK_{SM_n} \cdot Pbk_{SEP_i}$$
 (2)

$$Y = H(SID_{SM_n} || SK_{SM_n - SEP_i} || TM_x || Pbk_{SM_n})$$
(3)

where $SK_{SEP_j-SM_n}$ denotes the shared secret key and Pbk_{SEP_j} denotes the public key of SEP_j . In addition, SM_n splits Y equally into two parts, Y_a and Y_b , each with 128 bits. Moreover, SM_n computes the secret key as $K_{SM_n} = Y_a \oplus Y_b$, which is used in the encryption process and AD as $N_x = Y_a$. Furthermore, SM_n by using the ASCON encryption algorithm computes

$$(CT_x, APauth_x) = \mathcal{E}_{K_{SM_n}}\{(N_x), RN_x\}$$
 (4)

where CT_x and $APauth_x$ are the CT and authentication parameter. Finally, SM_n fabricates the message MG_1 : { TM_x , SID_{SM_n} , CT_x , $APauth_x$, Pbk_{SM_n} } and dispatches MG_1 to SEP_j via open channel.

2) Step AC-2: Upon procuring MG₁ from SM_n, the freshness of the received MG₁ is checked by SEP_j by validating the condition $T_{DL} \ge |T_{RM} - TM_x|$, where T_{DL} and TM_x denote the allowed time delay and generation time of MG₁, respectively. SEP_j terminates the AC process if SEP_j fails to validate the condition. Otherwise, SEP_j computes

$$SK_{SEP_i-SM_n} = SK_{SEP_i} \cdot Pbk_{SM_n}$$
 (5)

$$Z = H(SID_{SM_n} || SK_{SEP_i - SM_n} || TM_x || Pbk_{SM_n})$$
 (6)

where $SK_{SEP_j-SM_n}$ denotes the shared secret key and Pbk_{SM_n} represents the public key of SM_n . In addition to this, SEP_j splits Z into Z_a and Z_b , each of 128 bits. Additionally, to accomplish the decryption process, SEP_j determines the secret key as $K_{SEP_j} = Z_a \oplus Z_b$ and AD as $N_y = Z_a$. Furthermore, SEP_j by using ASCON decryption algorithm computes

$$(PT_y, APauth_y) = \mathcal{D}_{K_{SEP_i}}\{(N_y), CT_x\}.$$
 (7)

Finally, the condition APauth_x = APauth_y is validated by SEP_j to check the authenticity of the received MG₁. If it holds, SEP_j contemplates MG₁ as a valid message and extracts PT_y = $\{RN_x\}$ from the decryption process of ASCON. Otherwise, SEP_j terminates the AC process.

3) Step AC-3: After validating the authenticity of MG_1 , SEP_j computes $SP_2 = H(SK_{SEP_j} || ID_{SEP_j})$ and extracts PID_{SM_n} and RN_{SM_n} from the received SID_{SM_n} as follows:

$$(PID_{SM_n}||RN_{SM_n}) = SID_{SM_n} \oplus SP_2. \tag{8}$$

In addition to this, SEP_j checks if PID_{SM_n} exists in its own database. If it is found, SEP_j retrieves stored information $\{CT_{SEP_j}, APauth_{SEP_j}\}$ related to PID_{SM_n} . Moreover, SEP_j determines the secret key as $K_1 = SP_2^a \oplus SP_2^b$, where SP_2^a and SP_2^b are derived by dividing SP into two equal parts and AD $N_{SEP_j} = SP_2^a$. Furthermore, SEP_j extracts ID_{SM_n} and Key_{SM_n} associated with SM_n as follows:

$$((\mathrm{ID}_{\mathrm{SM}_n} \| \mathrm{Key}_{\mathrm{SM}_n}), \mathrm{APauth}'_{\mathrm{SEP}_i}) = \mathcal{D}_{K_1} \{ (N_{\mathrm{SEP}_i}), \mathrm{CT}_{\mathrm{SEP}_i} \}. \tag{9}$$

To validate the authenticity of the data stored at SEP_j , SEP_j requires to check the condition $APauth'_{SEP_j} = APauth_{SEP_j}$. If it holds, SEP_j continues the AC process. Otherwise, SEP_j terminates the AC process.

4) Step AC-4: After extracting ID_{SM_n} and Key_{SM_n} , SEP_j picks TM_z , RN_z , and $RN^n_{SM_n}$ with a size of 32, 128, and 128 bits, respectively. Moreover, SEP_j computes

$$(PID_{SM_n}||RN_{SM_n}^n) \oplus SP_2 = SID_{SM_n}^{new}$$
(10)

where $SID_{SM_n}^{new}$ is a new temporary identity, which will be used by SM_n to achieve anonymous communication. Moreover, SEP_i calculates

$$Q = H(SK_{SEP_i - SM_n} || ID_{SM_n} || Key_{SM_n} || TM_z || RN_x)$$
(11)

and determines $AD_z = Q_a \oplus Q_b$, $N_z = Q_a$, and $PT_z = (SID_{SM_n}^{new} \| RN_z)$, where AD_z , N_z , and PT_z are the AD, nonce, and PT, respectively. Furthermore, SEP_j by using the ASCON encryption process computes $(CT_z, APauth_z) = \mathcal{E}_{Key_{SM_n}} \{(N_z, AD_z), PT_z\}$. In addition, SEP_j computes the SK by computing $SK_{SEP_j} = H(Q \| RN_x \| RN_z \| TM_z)$ to achieve the encrypted communication in future. Finally, SEP_j composes a message $MG_2 : \{TM_z, CT_z, APauth_z\}$ and dispatches it to SM_n via an open channel.

5) Step AC-5: After receiving MG₂ from SEP_j, SM_n validates the freshness of the received message by verifying the condition $T_{\rm DL} \geq |T_{\rm RM} - {\rm TM}_z|$, where $T_{\rm DL}$ and ${\rm TM}_z$ denote the allowed time delay and generation time of MG₂, respectively. After the condition is successfully validated, SM_n computes RES_{SM_n} = PUF(Ch_{SM_n}) and Key_{SM_n} = Rep(RES_i, RP), where Ch_{SM_n}, RES_{SM_n}, and Key_{SM_n} are the

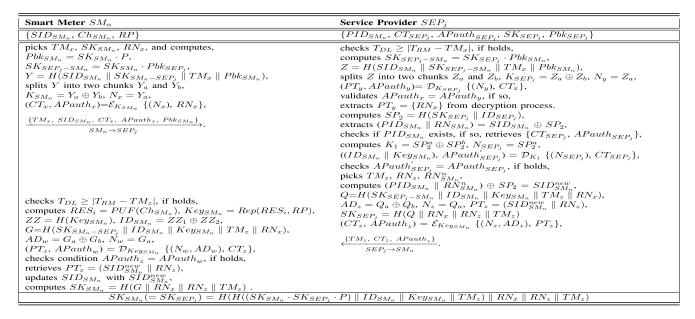


Fig. 4. RACP-SG AC phase.

challenge, response, and generated key, respectively. In addition, SM_n computes the identity as $ZZ = H(Key_{SM_n})$ and $ID_{SM_n} = ZZ_1 \oplus ZZ_2$. Moreover, SM_n computes

$$G = H(SK_{SM_n - SEP_i} || ID_{SM_n} || Key_{SM_n} || TM_z || RN_x)$$
 (12)

and splits G into G_a and G_b , each of 128 bits. In addition to this, SM_n determines $AD_w = G_a \oplus G_b$ and $N_w = G_a$. Here, AD_w and N_w denote AD and nonce, respectively. To determine the PT, SM_n by using ASCON computes

$$(PT_z, APauth_w) = \mathcal{D}_{Key_{SM_u}} \{ (N_w, AD_w), CT_z \}.$$
 (13)

Moreover, SM_n checks the condition $APauth_z = APauth_w$ to validate the authenticity of the received message. If it holds, SM_n retrieves $PT_z = (SID_{SM_n}^{new} \|RN_z)$ from the decryption process of ASCON. Furthermore, SM_n updates $SID_{SM_n}^{new}$ with $SID_{SM_n}^{new}$ to achieve the anonymous communication in the future. Finally, SM_n computes the SK as $SK_{SM_n} = H(G\|RN_x\|RN_z\|TM_z)$ to ensure indecipherable communication in future. The AC phase is summarized in Fig. 4.

D. Dynamic SM Addition Phase

In this phase, TA deploys a new SM_n by performing the same procedure as described in Section V-B from Step SMR-1 to Step SMR-3. However, to deploy a new SM_n , TA needs to select new parameters, such as RN^{new} , $PID^{new}_{SM_n}$, and $Ch^{new}_{SM_n}$.

VI. SECURITY ANALYSIS

The security analysis of the proposed RACP-SG is presented in this section. First, an informal analysis is presented to show that RACP-SG is secure against various security attacks, including MITM, impersonation, and replay attacks. Then, SK security is establish through the well-known ROM. Finally, the Scyther tool is used to show that RACP-SG is secure against various covert attacks.

A. Informal Security Analysis

This section proffers the informal security analysis of RACP-SG to illustrates RACP-SG's resiliency to resist various pernicious security attacks, such as MITM, impersonation, replay, and SM capture attacks.

- 1) Untraceability and Anonymity: There are two messages, such that MG_1 : { TM_x , SID_{SM_n} , CT_x , $APauth_x$, Pbk_{SM_n} } and MG_2 : { TM_z , CT_z , $APauth_z$ }, which are exchanged to accomplish the AC process in RACP-SG. SID_{SM_n} is computed as $SID_{SM_n} = (PID_{SM_n} || RN) \oplus SP$, where PID_{SM_n} is the identity, which is used to search the record related to SM_n . PID_{SM_n} cannot be derived from SID_{SM_n} because it is protected by $SP = H(ID_{SEP_i} || K_{SEP_i})$, where ID_{SEP_i} and K_{SEP_i} are known only to SEP_j. Therefore, A cannot extract PID_{SM_n} from SID_{SM_n} . In addition, SEP_j generates $SID_{SM_n}^{new}$, by selecting a fresh random number, and sends it to SM_n in the encrypted form. This new $SID_{SM_n}^{new}$ is used by SM_n during the new AC session. Therefore, it is hard for A to extract any parameter from seized messages that could enable it to trace SM_n and SEP_i. This suggests that RACP-SG provides the anonymity feature. Furthermore, MG₁ and MG₂ change dynamically and randomly for each new AC session in RACP-SG, making it impossible for A to relate the captured messages, such as MG₁ and MG₂ from two different AC sessions to extract any useful information. This suggests that RACP-SG ensures the untraceability feature.
- 2) De-Syn Attack: The De-Syn attack is possible only when the entities involved in the AC process update some of the parameters during the execution of each AC process to ensure anonymous communication. In RACP-SG, SID_{SM_n} is updated by SEP_j during the execution of every new AC session. SID_{SM_n} is computed as $SID_{SM_n} = (PID_{SM_n} || RN) \oplus SP$, where PID_{SM_n} represents the smart meter SM_n and RN is the random number. SEP_j constructs a new $SID_{SM_n}^{new} = (PID_{SM_n} || RN_{SM_n}^n) \oplus SP_2$, here PID_{SM_n} remains the same while SEP_j selects new random number $RN_{SM_n}^n$ generate new $SID_{SM_n}^{new}$. SM_n uses

this $SID_{SM_n}^{new}$ during each new AC session. \mathcal{A} cannot effectuate a De-Syn attack by drooping any of the message communicated during the AC process because PID_{SM_n} remains the same, which is used to retrieve the record related to SM_n . This suggests that RACP-SG is able to resist the De-Syn attack.

- 3) MITM Attack: According to the threat model defined in Section III-B, \mathcal{A} can expropriate all the communicated messages, such as MG_1 : $\{TM_x, SID_{SM_n}, CT_x, APauth_x, Pbk_{SM_n}\}$ and MG_2 : $\{TM_z, CT_z, APauth_z\}$ that are exchanged during the AC process. After capturing MG_1 , \mathcal{A} can generate a bogus message MG_1' to make SEP_j believe that MG_1' is from a legitimate SM_n . However, without knowing the secret credentials $\{SK_{SM_n}, SK_{SM_n-SEP_j}, PID_{SM_n}\}$, it is impractical for \mathcal{A} to fabricate a valid MG_1 . Similarly, it is hard for \mathcal{A} to generate MG_2 without knowing the secret credentials, i.e., $\{SK_{SEP_j}, SK_{SEP_j-SM_n}, ID_{SM_n}, Key_{SM_n}\}$. This suggests that RACP-SG is able to resist the MITM attack.
- 4) Replay Attack: According to the threat model defined in Section III-B, A can expropriate all the exchanged messages, i.e., MG_1 : { TM_x , SID_{SM_n} , CT_x , $APauth_x$, Pbk_{SM_n} } and MG_2 : { TM_z , CT_z , $APauth_z$ }, and can attempt to replay the captured message to entities of the SG system to obtain valuable information from the entities. In RACP-SG, all the entities of the SG system, which are involved in the AC process, are time synchronized. In addition, all the communicated messages, i.e., MG1 and MG1, incorporate the latest timestamp and fresh random number. A message receiving entity ensures the freshness of the received message by checking the condition $T_{DL} \ge |T_{RM} - TM_x|$ and $T_{DL} \ge |T_{RM} - TM_z|$ for MG₁ and MG₂, respectively. On failure, the corresponding entity drops the received message and terminates the AC process. In this way, the message receiving entity can detect the replay attack. Therefore, RACP-SG is able to resist the replay attack.
- 5) SM Capture Attack: According to the threat model defined in Section III-B, \mathcal{A} can capture an SM_n deployed in the SG system and can extract secret parameters, such as $\{SID_{SM_n} \text{ and } Ch_{SM_n}, RP\}$ stored in the memory of the SM_n by employing the power analysis attack. However, from the secret credentials obtained from a captured SM_n, \mathcal{A} cannot procure secret credentials of other noncaptured or noncompromised SM_n. In addition, the secret credentials are different for every deployed SM_n. Therefore, \mathcal{A} cannot breach the security of the noncompromised SM_n. Hence, the proposed RACP-SG is able to resist the SM_n capture attack.
- 6) Impersonation Attack: There are two messages, such as MG_1 : $\{TM_x, SID_{SM_n}, CT_x, APauth_x, Pbk_{SM_n}\}$ and MG_2 : $\{TM_z, CT_z, APauth_z\}$, which are communicated to accomplish the AC process in RACP-SG. \mathcal{A} can impersonate as legitimate SM_n by generating a valid MG_1 . However, \mathcal{A} cannot generate a licit message MG_1 on behalf of SM_n without knowing the secret parameters, such as $\{SK_{SM_n}, SK_{SM_n-SEP_j}, PID_{SM_n}\}$. Therefore, \mathcal{A} cannot effectuate the SM impersonation attack. Similarly, \mathcal{A} cannot impersonate as SEP_j without knowing the secret credentials, such as $\{SK_{SEP_j}, SK_{SEP_j-SM_n}, ID_{SM_n}, Key_{SM_n}\}$. Hence, the proposed RACP-SG can resist the SEP/SM impersonation attack.

TABLE III
DESCRIPTION OF DIFFERENT ROM QUERIES

Query	Purpose
$Send(\Pi^{p1}, Msg)$	This query is initiated by \mathcal{A} to launch an active attack by iteratively transmitting the message Msg to Π^{p1} with Π^{p1} also supposed to be responding.
$Test(\Pi^{p1})$	This query is leveraged by A to verify the validity of SK, i.e., if or not SK is a real or random output of a flipped coin ' B '.
$Reveal(\Pi^{p1})$	Making this query enables A to obtain the SK that is established between Π^{p1} and its partner entity.
$CorruptSM(\Pi^{p2}_{SM_n})$	This query leads A to, by means of power analysis attack, extract the sensitive information from memory of SM_n .
$Execute(\Pi^{p2}_{SM_n},\Pi^{p3}_{SEP_j})$	\mathcal{A} can leverage this query to access all the messages transmitted between SM_n and SEP_j .

7) ESL Attack: In RACP-SG, the SK is computed as $SK_{SM_n} = (SK_{SEP_j}) = H(H((SK_{SM_n} \cdot SK_{SEP_j} \cdot P) || ID_{SM_n} || Key_{SM_n} || TM_z) || RN_x || RN_z || TM_z), which is the amalgamation of long term secret (LTS) {<math>ID_{SM_n}$, Key_{SM_n} } and ephemeral secrets (ES), such as { RN_x , RN_z , SK_{SM_n} , SK_{SEP_j} }. Therefore, to break the security of the establish SK, \mathcal{A} requires to know both the LTS and ES. Thus, RACP-SG is capable of withstanding the ESL attack.

B. ROM-Based Formal Security Analysis

In this section, we present the ROM-based analysis of our proposed RACP-SG protocol in order to verify security of the SK that is established between SM_n and SEP_j. Let Π_{RC}^{p1} , $\Pi_{SM_n}^{p2}$, and $\Pi_{SEP_j}^{p3}$ denote instances p1, p2, and p3 of the participants RA, SM_n, and SEP_j, also called oracles. ROM has various components, as detailed in [32], which are associated with the various queries used by \mathcal{A} .

The DY model designates that \mathcal{A} can expropriate all the messages propagated between the entities in the SG environment. This signifies that \mathcal{A} , utilizing the queries represented in Table III, can modify, inject, and delete the communicated messages. Moreover, this also designates that \mathcal{A} can access the hash function $H(\cdot)$, which is represented as a random-oracle, say ASHsh. Above this, the queries, represented in Table III, are utilized by \mathcal{A} to simulate an attack.

SK's Semantic Security: \mathcal{A} needs to differentiate an instance's real SK from a random number, under ROM. Furthermore, \mathcal{A} has the ability to perform many Test queries to either Π^{p1} or Π^{p2} . At the end of the game, bit B' is guessed by \mathcal{A} . \mathcal{A} will win the game if B = B'. \mathcal{A} 's advantage in breaching SK's security semantics is denoted by $\mathrm{ADV}_{\mathcal{A}}^{\mathrm{RACP-SG}}$ (POT) = $|2 \cdot Prb[SU] - 1|$, where SU represents the event, in which \mathcal{A} can win the game. RACP-SG is secure if $\mathrm{ADV}_{\mathcal{A}}^{\mathrm{RACP-SG}}$ (POT) is insignificant under ROM.

Definition 2: Let polynomial-time \mathcal{A} execute against the AEAD scheme and perform at maximum QU queries of range space LN to the encryption/decryption oracle. Then, the online chosen CT attack (OCCA3) advantage of \mathcal{A} can be defined as [32]–[34]

$$\begin{aligned} & ADV_{\varphi}^{OCCA3}(\mathcal{A}) \leq ADV_{\varphi}^{OPRP-CPA}(QU, LN, POT) \\ & + ADV_{\varphi}^{INT-CTXT}(QU, LN, POT) \end{aligned} \tag{14}$$

where ADV, INT-CTXT, and OPRP-CPA denote the advantage, integrity of CT, and online pseudorandom permutation chosen-plaintext attack, respectively.

Theorem 1: Let \mathcal{A} running against RACP-SG in POT to obtain the SK, which is established between smart meter SM_n and service provider SEP_j. If H_{qu} signifies hash function (ASCON-hash) quires, |ASHsh| denotes range space of hash function (ASCON-hash) output, H_{pf}^2 represents the PUF queries, |PUF| denotes the range space of PUF. ADV_A^{ECDLP}(POT) and ADV_{ASCON,A}(QU, LN, POT) represent the advantage of \mathcal{A} in solving ECDLP and breaking the security ASCON (Definition 2), respectively. The advantage of \mathcal{A} in breaking RACP-SG's security, for procuring the SK, established between SM_n and SEP_j can be represented as

$$\begin{split} \text{ADV}_{\mathcal{A}}^{\text{RACP-SG}}(\text{POT}) &\leq \frac{H_{\text{qu}}^2}{|\text{ASHsh}|} + \frac{H_{\text{pf}}^2}{|\text{PUF}|} \\ &+ 2.\text{ADV}_{\text{ASCON},\mathcal{A}}^{\text{OCCA3}}(\text{QU, LN, POT}) \\ &+ \text{ADV}_{\mathcal{A}}^{\text{ECDLP}}(\text{POT}). \end{split} \tag{15}$$

Proof: The security of established SK is validated in the succeeding five games $(Gm_x|x=0,1,2,3,4)$ by employing the queries presented in Table III.

 Gm_0 : A real attack is launched by \mathcal{A} on RACP-SG under ROM. It is necessary for \mathcal{A} to imagine the bit b at the start of Gm_0 . Then, we get

$$ADV_{\mathcal{A}}^{RACP-SG}(POT) = |2.Prb[SU0] - 1|. \tag{16}$$

 Gm_I : An eavesdrop attack is effectuated by \mathcal{A} in this game. \mathcal{A} by using Execute($\Pi_{SM_n}^{p2}$, $\Pi_{SEP_j}^{p3}$) query captures all the messages, such as MG₁: {TM_x, SID_{SM_n}, CT_x, APauth_x, Pbk_{SM_n}} and MG₂: {TM_z, CT_z, APauth_z}, which are exchanged during the AC process. After capturing the messages, \mathcal{A} attempts to construct the SK, which is computed as SK_{SM_n}(= SK_{SEP_j}) = $H(H((SK_{SM_n} \cdot SK_{SEP_j} \cdot P) \| ID_{SM_n} \| Key_{SM_n} \| TM_z) \| RN_x \| RN_z \| TM_z)$ by making the Test and Reveal queries. AS SK is constructed by using both LTS and ES credentials. Therefore, to derive SK, \mathcal{A} needs to know both ES and LTS credentials. The probability of deriving SK, only by capturing the exchanged messages during AC process, will not increase at all. Now, under eavesdrop attack both Gm_0 and Gm_1 become indistinguishable. Therefore, we have

$$Prb[SU0] = Prb[SU1]. \tag{17}$$

 Gm_2 : Gm_2 effectuates an active attack by simulating Send and ASHsh queries. In Gm_2 , \mathcal{A} requires to make believe an entity into receiving a bogus (modified) message. \mathcal{A} is allowed to make several ASHsh queries to find the collisions in hash digests. Since, all the communicated messages MG_1 and MG_2 indirectly incorporate entity's identity, SP/SP_2 , and LTS, which are protected by ASCON-hash. \mathcal{A} makes several ASHsh/Send queries to find the collision. However, it is hard for \mathcal{A} to find collision because the ASCON-hash function is collision resistant. Therefore, by the birthday paradox

$$|Prb[SU1] - Prb[SU2]| \le \frac{H_{\text{qu}}^2}{2|ASHsh|}.$$
 (18)

 Gm_3 : In this game, \mathcal{A} launches an active attack by simulating CorruptSM($\Pi^{p2}_{SM_n}$) query. For this purpose, \mathcal{A} by capturing

one or more SM_n extract all the sensitive information stored in its memory using the power analysis attack. \mathcal{A} cannot compute the SKs established between SEP_j and other noncompromised SM_n in the SG system as the parameters challenge Ch_{SM_n} is distinct for each SM_n . In addition, PUF generates unique output (response) for every input (challenge). Due this property of PUF function, it is infeasible for \mathcal{A} to find the collision (same output for two different inputs). According to Gm_3 , it follows:

$$|Prb[SU3] - Prb[SU2]| \le \frac{H_{\rm pf}^2}{2|PUF|}.$$
 (19)

 Gm_4 : In this game, \mathcal{A} captures all the messages, such as MG_1 :{ TM_x , $\mathrm{SID}_{\mathrm{SM}_n}$, CT_x , APauth_x , $\mathrm{Pbk}_{\mathrm{SM}_n}$ } and MG_2 : { TM_z , CT_z , APauth_z }, which are exchanged during the AC process. \mathcal{A} attempts to decrypt CT_x and CT_z to procure the sensitive information required to construct the SK. As the CT_x is encrypted with the OCCA3 secure AEAD scheme, known as ASCON (Definition 2) and using the key $K_{\mathrm{SM}_n} = Y_a \oplus Y_b$, which is derived from $Y = H(\mathrm{SID}_{\mathrm{SM}_n}\|\mathrm{SK}_{\mathrm{SM}_n-\mathrm{SEP}_j}\|\mathrm{TM}_x\|\mathrm{Pbk}_{\mathrm{SM}_n})$. \mathcal{A} cannot derive the parameter Y because it contains $\mathrm{SK}_{\mathrm{SM}_n-\mathrm{SEP}_j}$, which is derived as $\mathrm{SK}_{\mathrm{SEP}_j-\mathrm{SM}_n} = \mathrm{SK}_{\mathrm{SM}_n} \cdot \mathrm{Pbk}_{\mathrm{SEP}_j}$. In addition, it is hard for \mathcal{A} to derive the secret key $\mathrm{SK}_{\mathrm{SM}_n}$ from public key $\mathrm{Pbk}_{\mathrm{SM}_n}$ of SM_n because to derive $\mathrm{SK}_{\mathrm{SM}_n}$ from $\mathrm{Pbk}_{\mathrm{SM}_n}$ is an ECDLP as demonstrated in (Definition 1). This concludes that

$$|Prb[SU3] - Prb[SU4]| \le ADV_{ASCON, \mathcal{A}}^{OCCA3}(QU, LN, POT) + ADV_{\mathcal{A}}^{ECDLP}(POT).$$
 (20)

After executing all queries, A needs to presume bit B' for winning the game after making the Test query. It is then obvious that

$$Prb[SU4] = 1/2.$$
 (21)

From (16) and (17), we get

$$ADV_{\mathcal{A}}^{RACP-SG}(POT) = |2.Prb[SU0] - \frac{1}{2}|.$$
 (22)

From (22), we get

$$\frac{1}{2}.\text{ADV}_{\mathcal{A}}^{\text{RACP-SG}}(\text{POT}) = |Prb[SU0] - \frac{1}{2}|. \tag{23}$$

By using (21) and (23), we obtain

$$\frac{1}{2}.ADV_{\mathcal{A}}^{RACP-SG}(POT) = |Prb[SU1] - Prb[SU4]|. \quad (24)$$

By using the triangular inequality, we get

$$|Prb[SU1] - Prb[SU4]| \le |Prb[SU1] - Prb[SU2]|$$

$$+|Prb[SU2] - Prb[SU4]|$$

$$\le |Prb[SU1] - Prb[SU2]| + |Prb[SU2] - Prb[SU3]|$$

$$+|Prb[SU3] - Prb[SU4]|. \tag{25}$$

By using (18)–(20) and (25), we get

$$\begin{split} & \text{ADV}_{\mathcal{A}}^{\text{RACP-SG}}(\text{POT}) \leq \frac{H_{\text{qu}}^2}{|\text{ASHsh}|} + \frac{H_{\text{pf}}^2}{|\text{PUF}|} \\ & + 2.\text{ADV}_{\text{ASCON},\mathcal{A}}^{\text{OCCA3}}(\text{QU, LN, POT}) + \text{ADV}_{\mathcal{A}}^{\text{ECDLP}}(\text{POT}). \end{split}$$

Claim				Status	Comments
RACP SM		RACP,SM2	Secret _Hidden_ 1	Ok	No attacks within bounds
		RACP,SM3	Secret APauthz	Ok	No attacks within bounds
		RACP,SM4	Secret CTZ	Ok	No attacks within bounds
		RACP,SM5	Alive	Ok	No attacks within bounds
		RACP,SM6	Weakagree	Ok	No attacks within bounds
		RACP,SM7	Niagree	Ok	No attacks within bounds
		RACP,SM8	Nisynch	Ok	No attacks within bounds
	SEP	RACP,SEP2	Secret _Hidden_3	Ok	No attacks within bounds
		RACP,SEP3	Secret _Hidden_ 2	Ok	No attacks within bounds
		RACP,SEP4	Alive	Ok	No attacks within bounds
		RACP,SEP5	Weakagree	Ok	No attacks within bounds
		RACP,SEP6	Niagree	Ok	No attacks within bounds
		RACP,SEP7	Nisynch	Ok	No attacks within bounds

Fig. 5. Scyther-based Security Analysis of RACP-SG.

TABLE IV
COMPUTATIONAL TIME OF VARIOUS CRYPTOGRAPHIC PRIMITIVES

Cryptographic Primitive	Notations	Computational Time (Raspberry Pi-3)	Server (SEP_j)
ECC point Multiplication	T_{ECC}	2.50 ms	0.747 ms
ECC point Addition	T_{ECA}	0.134 ms	0.003 ms
Hash Function (16 bytes)	$T_{HF} \approx T_{AHF}$	0.345 ms	0.060 ms
Physical Unclonable Function (PUF)	T_{PUF}	0.5 μs	-
ASCON (AEAD scheme)	T_{AC}	0.35 ms	0.061 ms
FE bio-metric key reproduction	$T_{Rep} \approx T_{ECC}$	2.50 ms	0.747 ms

C. Scyther-Based Security Analysis

A formal verification tool Scyther [35] is utilized to study the design defects and characteristics of RACP-SG. Scyther uses a security protocol description language (SPDL), a python-like language, for the implementation of the proposed security protocol, which applies the semantics given in [35]. For a security protocol defined in SPDL, Scyther tries to achieve: 1) affirmation of the claims defined in the specified protocol; 2) affirmation of the security claims that are generated automatically by the Scyther tool; and 3) the comprehensive characterization of the defined roles. There are two roles described in RACP-SG, namely, SM_n and SEP_i . It is explicit from Fig. 5 that RACP-SG is secure. Fig. 5 also explicates that both the manually (defined in SPDL) presented claims in the SPDL script, i.e., Claim (SM, Secret, SK) and Claim (SEP, Secret, SK), and the automatically produced claims, i.e., weak agreement, aliveness, and noninjective agreement (niagree), are "OK."

VII. PERFORMANCE EVALUATION

In this section, we compare RACP-SG with the schemes presented in [13], [14], and [36]–[38]. For performance metrics, we consider security capabilities and communication, storage, and computational overheads. We simulate SM using Ubuntu LTS-16.4 and Raspberry Pi-3/Quad core @1.2 GHz with 1-GB RAM and SEP using Ubuntu LTS-16.4 and Intel Core i7-6700 CPU @ 3.40G with 8-GB RAM. Furthermore, we use ASCON and PyCrypto—a python-based cryptography library—to find out the execution time of ASCON and various cryptographic primitives. We use Raspberry Pi-3/Quad core @1.2 GHz, and 1-GB RAM to evaluate the computational overhead of PUF like [39]. Table IV presents the computational time of various cryptographic primitives.

TABLE V
SECURITY FEATURES COMPARISON

Features	Bera et al. [14]	Das et al [36]	Malani et al. [37]	Bera et al [13]	Bera et al [38]	RACP-SG
PI	√	√	√	√	√	√
DI	✓	×	×	✓	×	✓
RA	✓	×	✓	✓	×	✓
MITM	✓	×	✓	✓	×	✓
DS	×	✓	✓	×	✓	✓
UT	✓	✓	×	×	×	✓
Scyther/AVISPA	✓	✓	✓	✓	✓	✓
DCA	✓	✓	✓	✓	✓	✓
DoS	✓	✓	✓	✓	✓	✓
ROM	✓	✓	✓	✓	✓	✓

Note: UT: Anonymity/Untraceablity; SI: Scyther Implantation; MA: Mutual Authentication; RA: Replay Attack; ROM: Random Oracle Model; ✓: denotes the availability of features; × : indicates the feature not available

A. Security Features Comparison

Table V presents the comparison of the security features of RACP-SG and the related AC protocols. It is obvious from the table that the scheme presented in [13] does not provide resistance against the De-Syn attack. Similarly, the scheme presented in [36] cannot protect replay, MITM, and device impersonation attacks and also does not provide untraceability feature. Likewise, the scheme presented in [37] cannot protect the device impersonation attack and untraceability feature. Besides, the scheme presented in [13] is insecure against the De-Syn attack and lacks untraceability feature. Lastly, the scheme presented in [38] cannot protect replay, device impersonation, and MITM attacks and does not render the untraceability feature. On the contrary, RACP-SG is secure against the De-Syn, MITM, replay, and device impersonation attacks while ensuring the anonymity and untraceability of the involved entities in the AC process.

B. Computational Overhead

We evaluate the computational overhead of RACP-SG and the related AC protocol using the computational time of different cryptographic primitives as tabulated in Table IV. The average computational time of each cryptographic primitive is determined after 100 runs. RACP-SG requires $8T_{HF}$ + $3T_{\rm ECC} + 5T_{\rm AC} + T_{\rm Rep} + T_{\rm PUF} \approx 12.87$ ms computational overhead to accomplish the AC process, while Bera et al. [14], Das et al. [36], Malani et al. [37], Bera et al. [13], and Bera et al. [38] required $18T_{\rm HF} + 10T_{\rm ECC} + 3T_{\rm ECA} \approx$ 23.037 ms, $12T_{HF} + 14T_{ECC} + 6T_{ECA} \approx 28.75$ ms, $15T_{HF} +$ $12T_{\text{ECC}} + 4T_{\text{ECA}} \approx 25.137 \text{ ms}, 10T_{\text{HF}} + 8T_{\text{ECC}} + 2T_{\text{ECA}} +$ $2T_{PO} \approx 17.8 \text{ ms}$, and $22T_{HF} + 8T_{ECC} + 2T_{ECA} \approx 23.41 \text{ ms}$, respectively. Similarly, Table VI demonstrates that RACP-SG incurs less computational overhead as compared to the related stat of the art. Besides, Fig. 6 shows that RACP-SG requires lesser computational overhead at SEP_i than the existing AC protocols as the number of request increases.

C. Communication Overhead

To estimate the communication overhead, we consider the number of messages exchanged and bits transmitted over the communication channel between SM_n and SEP_j . In addition, the communication overhead is determined by considering the size of various parameters, such as ID_{SM_n} , APauth, timestamp, hash function, random number, and ECC point as 128, 128, 32, 256, 128, and 320 bits, respectively. Two message

TABLE VI COMPARISON OF COMPUTATIONAL OVERHEAD

Protocol/Scheme	SM/D_a Side	SEP/D_b Side	Total Time
Bera et al. [14]	$9T_{HF} + 4T_{ECC} + T_{ECA}$	$9T_{HF} + 6T_{ECC} + 2T_{ECA}$	$18T_{HF} + 10T_{ECC} + 3T_{ECA} \approx 23.037 \text{ ms}$
Das et al. [36]	$6T_{HF} + 7T_{ECC} + 3T_{ECA}$	$6T_{HF} + 7T_{ECC} + 3T_{ECA}$	$12T_{HF} + 14T_{ECC} + 6T_{ECA} \approx 28.75 \text{ ms}$
Malani et al. [37]	$7T_{HF} + 5T_{ECC} + 2T_{ECA}$	$8T_{HF} + 7T_{ECC} + 2T_{ECA}$	$15T_{HF} + 12T_{ECC} + 4T_{ECA} \approx 25.137 \text{ ms}$
Bera et al. [13]	$5T_{HF} + 4T_{ECC} + T_{ECA} + T_{PO}$	$5T_{HF} + 4T_{ECC} + T_{ECA}$	$10T_{HF} + 8T_{ECC} + 2T_{ECA} \approx 17.8 \text{ ms}$
Bera et al. [38]	$11T_{HF} + 4T_{ECC} + T_{ECA}$	$11T_{HF} + 4T_{ECC} + T_{ECA}$	$22T_{HF} + 8T_{ECC} + 2T_{ECA} \approx 23.41 \text{ ms}$
RACP-SG	$4T_{AHF} + 2T_{AC} + 2T_{ECC} + T_{Rep} + T_{PUF}$	$4T_{AHF} + T_{ECC} + 3T_{AC}$	$8T_{AHF} + 3T_{ECC} + 5T_{AC} + T_{Rep} + T_{PUF} \approx 12.870 \text{ ms}$

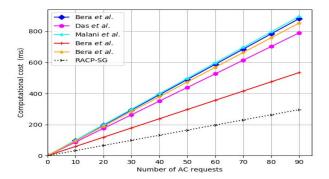


Fig. 6. Computational overhead required to process AC requests from multiple SM_n concurrently.

TABLE VII
COMMUNICATION OVERHEAD DURING THE AC PHASE

AC Protocol	Messages Exchanged during AC phase	Total (bits)
Bera et al. [14]	$SM_n/D_a \xrightarrow{928} SEP_j/D_b \xrightarrow{1122} SM_n/D_a \xrightarrow{288} SEP_j/D_b$	2336
Das et al. [36]	$SM_n/D_a \xrightarrow{1472} SEP_j/D_b \xrightarrow{1632} SM_n/D_a \xrightarrow{192} SEP_j/D_b$	3296
Malani et al. [37]	$SM_n/D_a \xrightarrow{992} SEP_j/D_b \xrightarrow{1152} SM_n/D_a$	2144
Bera et al. [13]	$SM_n/D_a \xrightarrow{672} SEP_j/D_b \xrightarrow{832} SM_n/D_a \xrightarrow{192} SEP_j/D_b$	1696
Bera et al. [38]	$SM_n/D_a \xrightarrow{1184} SEP_j/D_b \xrightarrow{1280} SM_n/D_a \xrightarrow{288} SEP_j/D_b \xrightarrow{288} SM_n/D_a$	3040
RACP-SG	$SM_n/D_a \xrightarrow{864} SEP_j/D_b \xrightarrow{544} SM_n/D_b$	1408

exchanges are required to accomplish the AC phase. Message MG_1 : { TM_x , SID_{SM_n} , CT_x , $APauth_x$, Pbk_{SM_n} } sent by SM_n consumes {32 + 256 + 128 + 128 + 320} = 864 bits and message MG_2 : { TM_z , CT_z , $APauth_z$ } transmitted by the SEP_j consumes {32 + 256 + 128 + 128} = 544 bits. Hence, the total communication overhead of the proposed RACP-SG is {864 + 544} = 1408 bits. However, the communication overhead of Bera *et al.* [14], Das *et al.* [36], Malani *et al.* [37], Bera *et al.* [13], and Bera *et al.* [38] is 2336, 3296, 2144, 1696, and 3040 bits, respectively. It is evident from Table VII that RACP-SG entails less communication overhead as opposed to the existing AC protocols.

D. Storage Overhead

In the proposed RACP-SG, SM_n and SEP_j need to store $\{SID_{SM_n}, Ch_{SM_n}, RP\}$ and $\{PID_{SM_n}, CT_{SEP_j}, APauth_{SEP_j}, SK_{SEP_j}, Pbk_{SEP_j}\}$, respectively. The storage needs at SM_n and SEP_j are $\{256+128+160\}=544$ bits and $\{128+256+128+320\}=832$ bits, respectively. Thus, the total storage requirement of RACP-SG is $\{544+832\}=1376$ bits. However, the storage overhead of Bera *et al.* [14], Das *et al.* [36], Malani *et al.* [37], Bera *et al.* [13], and Bera *et al.* [38] is 2280, 2240, 1920, 2400, and 3008 bits, respectively. Fig. 7 shows the storage overhead comparison of RACP-SG and the

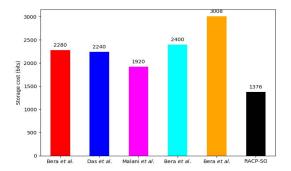


Fig. 7. Total storage overhead required to accomplish the AC process.

related state of the art. It is clear from the figure that RACP-SG requires less storage overhead as compared to the related AC protocols.

VIII. CONCLUSION

This article has proposed a novel AC protocol for the SG systems, called RACP-SG, which employs an LWC-based AEAD scheme and a hash function along with ECC to perform the AC phase. RACP-SG allows an SM and a SEP to mutually authenticate each other and establish an SK that the SM can leverage to communicate with the SEP for data transfer securely. We verified the security of the SK using the widely accepted ROM. By conducting Scyther-based and informal security analyses, we demonstrated that RACP-SG is secure against various covert attacks with reduced storage, communication, and computational overheads compared to the state of the art.

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